

# Detecting Extreme Mass-Ratio Inspirals using Time-Frequency Method

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06/23/05

LISA 6, NASA/GSFC, June, 2006

In collaboration with

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# Outline

- Characteristic of EMRIs
- Time-Frequency detection method
- Performance
- Discussion
  - Confusion problem
  - Parameter estimation

# Extreme Mass-Ratio Inspirals (EMRIs)

- Typical systems :
  - white dwarfs, neutron stars, and stellar-mass black holes ( $0.6\text{-}50\text{ Msun}$ ) onto  $10^5\text{--}5\times 10^6\text{ Msun}$  super-massive Black Holes.
- Large parameter space
  - $\sim 14$  parameters, 7 intrinsic
  - Spin  $S$ , and eccentricity are important

$$M, \mu$$

$$(S, \lambda_{LS}), e_0, \text{pericenter } \gamma_0, \text{initial phase } \phi_0$$

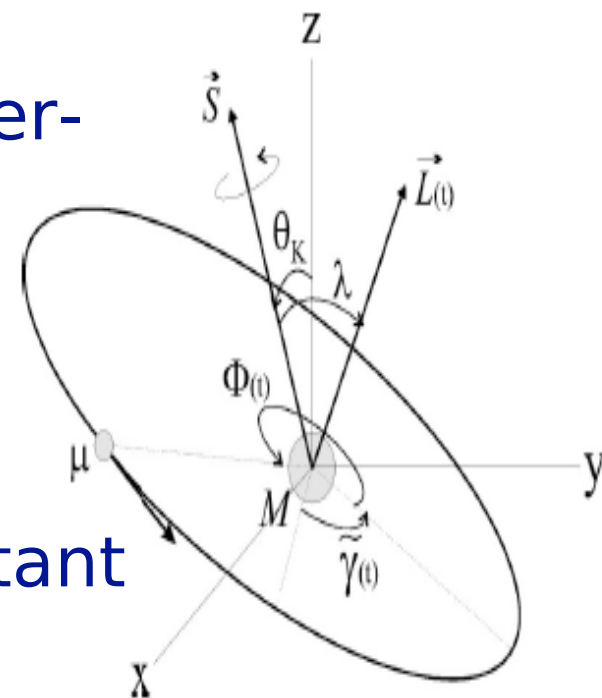


Fig. from Barack & Cutler 2004

# Extreme Mass-Ratio Inspirals (EMRIs)

- Event rate is high
  - Estimated number of EMRI events is high  
(Gair, L. 2004; LISA Report, Barack L. et al.)
  - The event rate can be  $\sim 1000$  in 3-5 years within  $\sim 3.5$  Gpc for  $10+10^6 M_{\text{sun}}$  systems.
  - Problem with identifying events
    - galactic WD-WD binary and possibly EMRI background

# EMRIs: data analysis perspective

- rms SNR at each frequency is small
  - Typically  $< 0.1$

$$h \sim 6 \times 10^{-22} \left| \frac{r}{Gpc} \right|^{-1} \left| \frac{M}{10^6 M_s} \right|^{2/3} \frac{\mu}{10 M_s} \left| \frac{f}{5 mHz} \right|^{2/3}$$

- Detections based on simple Fourier transform are generally not possible

# EMRIs: data analysis aspect

- Merging frequency scaled inversely with mass

$$f_M \sim \frac{4.4}{M/10^6 M_S} \text{ mHz}$$

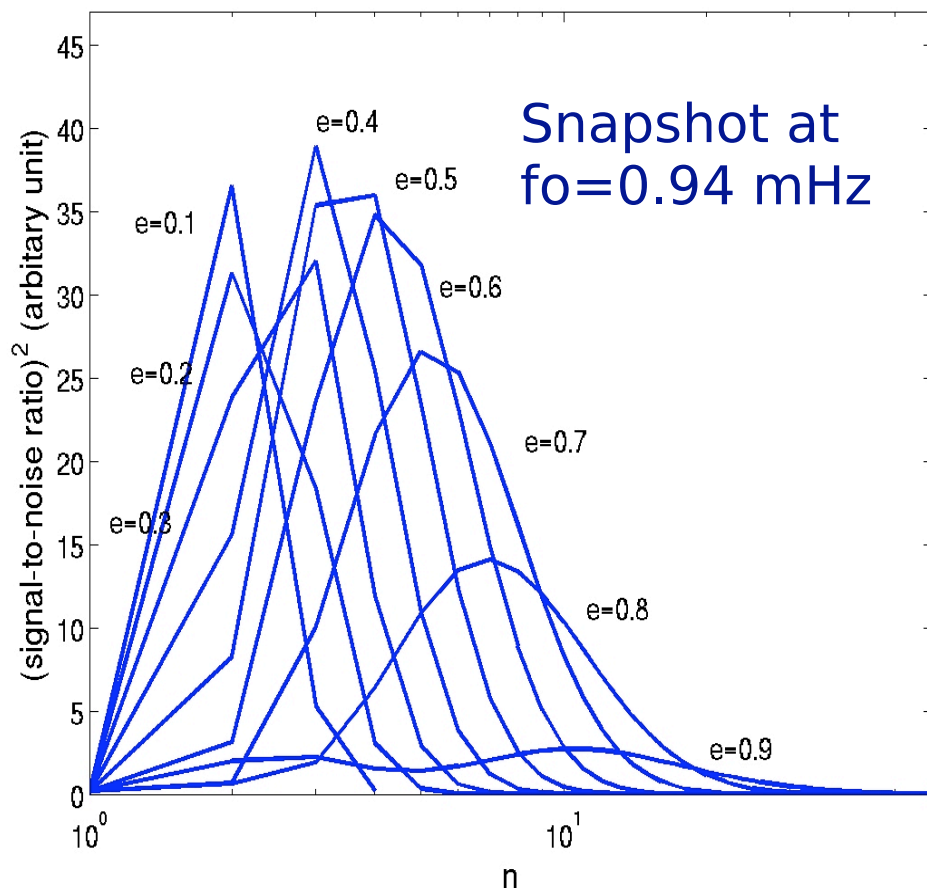
- Large number of frequency bins

$$N_f \sim f_M / df \sim 5 \times 10^5 \quad (\text{for } T = 3 \text{ yr}, f_m = 5 \text{ mHz})$$

$$SNR(d \sim 1 \text{ Gpc}) \sim 100$$

# Extreme Mass-Ratio Inspirals (EMRIs)

$$SNR_n^2 \propto \frac{\dot{E}(f_n)}{\dot{f}_n f_n S_h(f_n)} \Delta(\ln f_n)$$



Orbits are typically eccentric

- $e \sim 0.1-0.7$ , signal power spreads into many harmonics
- At  $e > 0.1$ , especially at low- $f$ , SNRs at higher harmonics become important due to noise response



# Extreme Mass-Ratio Inspirals (EMRIs)

- Complicated waveform
  - Three Characteristic frequencies
    - radial frequency
    - GR periastron precession
    - orbital plane precession from S-L coupling
  - Modulation from LISA's orbital motion
    - Amplitude
    - Frequency

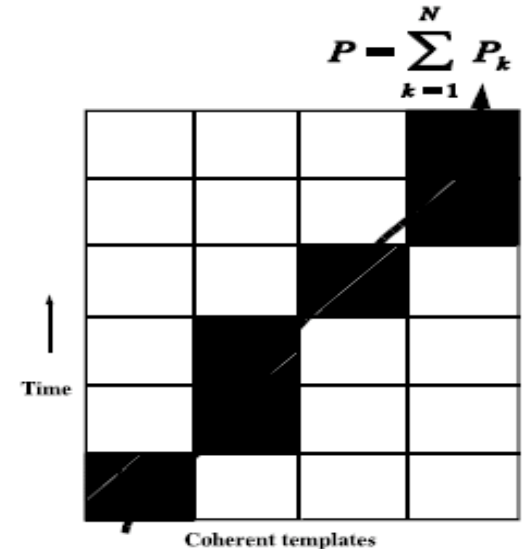
(Cutler 98, Barack & Cutler 2004)

# EMRIs: Computational Challenge

- Fully coherent detection is impossible
    - Waveform can eventually be calculated
    - Optimal: best in MLR/SNR
    - impossible computational cost
      - $\sim 10^{30} - 10^{40}$  templates needed for fully coherent search of 3 year of data
      - $\sim 10^{12}$  templates/yr possible for 50 Tflop computer cluster ....
- (Cutler's talk, Gair, L. et al 2004, LIST Report)

# EMRIs: Alternative Method

- Semi-coherent method
  - Search segments of data coherently but add incoherently
- Search for  $10^{10}$  templates coherently
  - 2wk coherent search for 3 yr data
  - Use all available computer power
  - Then add powers along  $\sim 1e5$  tracks
- SNR required increased by a factor of  $\sim 2$  from full coherent one at FAP $\sim 0.01$



(Cutler's talk. Gair et al. 2004)

# EMRIs: Time-Frequency Methods

- incoherent method
  - No templates
  - Search for maximum power density in t-f plane
    - Windowed FFT for every two weeks' data
    - For each point in t-f plane, given a rectangular box, calculate total power weighted by noise

$$P(i, k) = 2 \left| h_k^i + n_k^i \right|^2 / \sigma_{ik}^2$$
$$\rho(i, k) = \sum_{a=i-n/2}^{a=i+n/2} \sum_{b=k-l/2}^{b=k+l/2} P(i, k)$$
$$\langle \rho(i, k) \rangle = \rho_{MF} + 4m$$

# EMRIs: Time-Frequency Methods

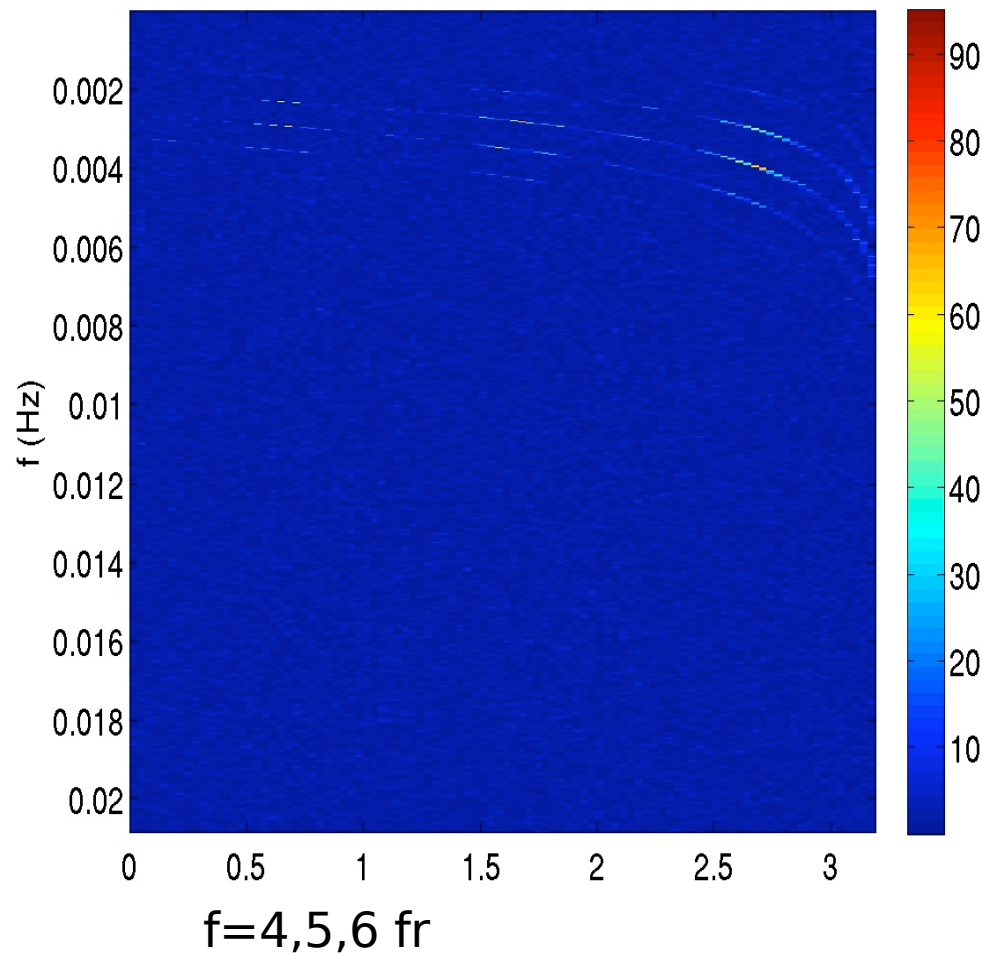
- Robust/popular
  - Signal increases by a factor  $\sim N$ , noise by  $\sqrt{N}$
  - widely used in X-ray astronomy
    - e.g., search for kilo-hertz QPOs in LMXBs
  - Density mapping method is the same as in cosmological N-body simulation to pick out clusters
  - In LIGO data analysis, it is called “excess power” method
  - Simple and fast
    - run-time  $\sim$  minutes, Matlab code: tens of lines

# Simulated Waveforms

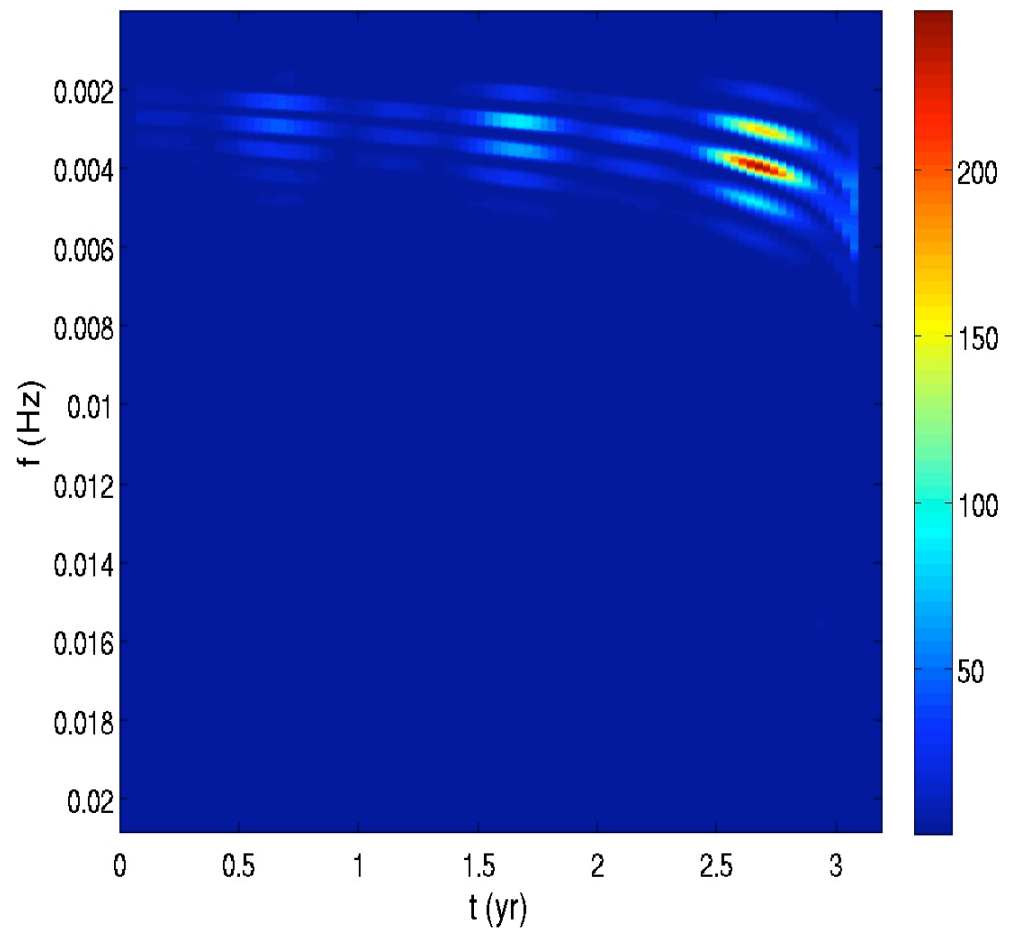
- Kludge Waveform
  - Solve exact Kerr geodesic equations
  - PN formula to evolve conservative quantities
  - Quadrupole GW waveform
  - Convolved with LISA orbital amplitude and Doppler modulation
  - Glampedakis, Hughes, Kennefick (2002)  
Gair et al (2005)

*Illustration of a bright  $10+1e6 M_{\text{sun}}$  EMRI in  $t$ - $f$  plane (at 250 Mpc)*

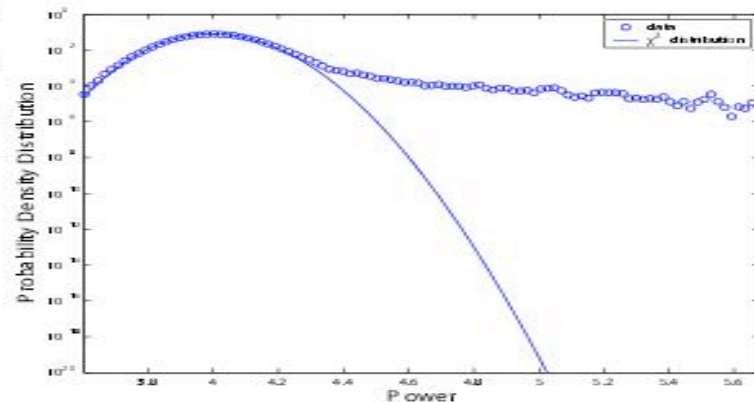
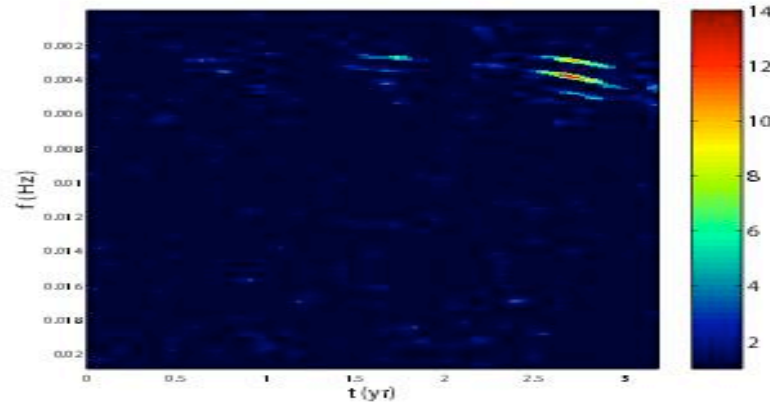
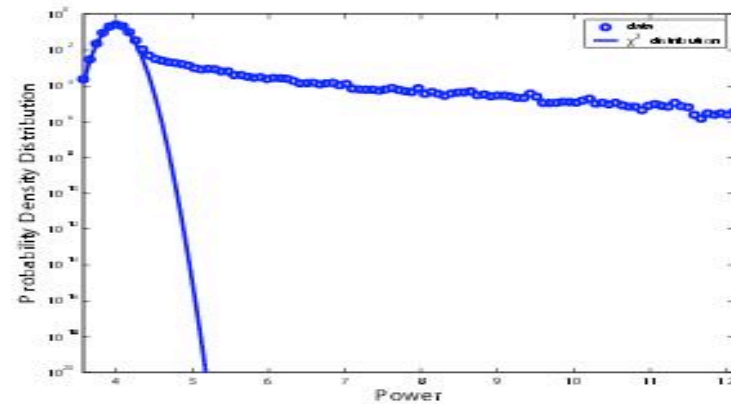
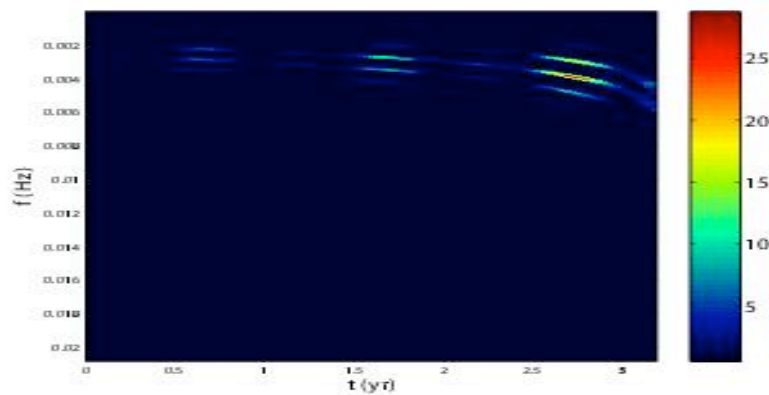
“Raw” T-F Powers



T-F Power density SNR



# EMRIs: Time-Frequency Methods (typical case at 0.5, and 1 Gpc)

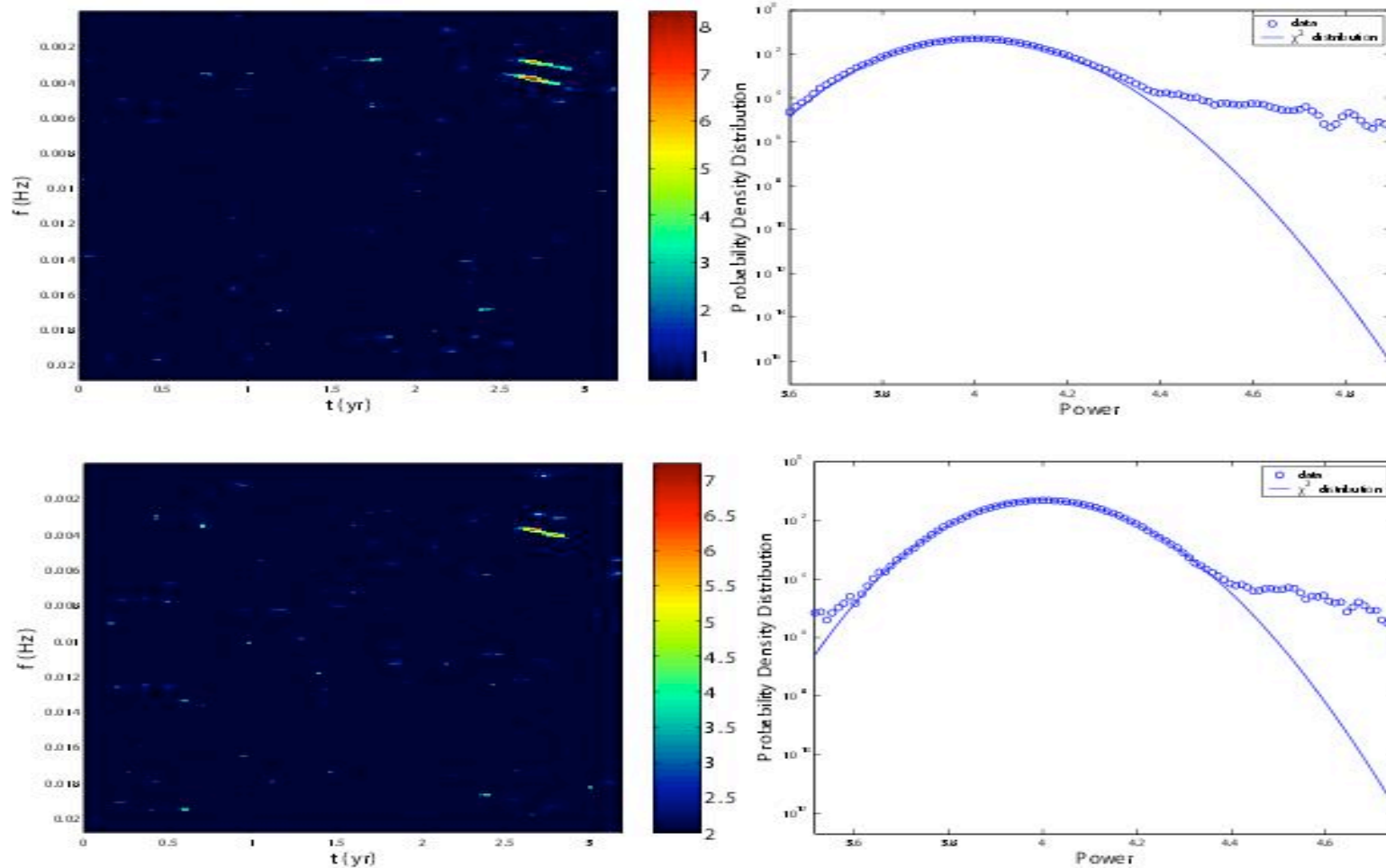


$M=1e6+10$ ,  $e_0=0.4$ ,  $a=0.8$



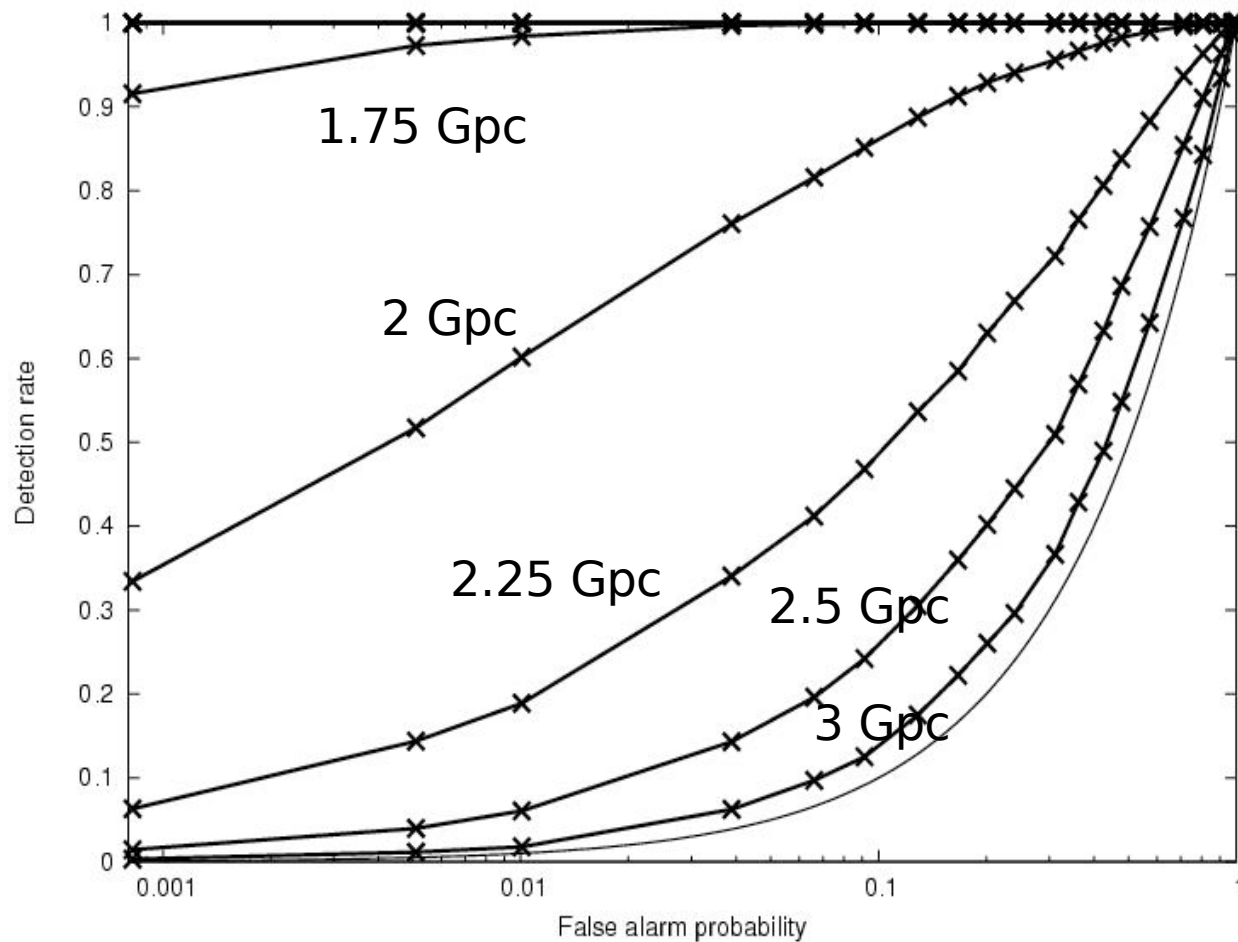
# EMRIs: Time-Frequency Methods

(typical case at 1.4, 2 Gpc)



$M=1e6+10$ ,  $e_0=0.4$ ,  $a=0.8$

# Monte-Carlo Results: Detection Rate vs False Alarm Probability



At  $d=2$  Gpc,  $FAP = 0.01$ , detection rate  $\sim 60\%$

# EMRIs: Time-Frequency Methods

- Typical case, reach 2 Gpc for FAP=0.01
  - Detection based on power density from  $\sim 2$  wks' data,  $\sim 0.2$  mHz frequency band  
(Wen & Gair 2005)
  - Monte-Carlo simulation performed for 26 possible systems (different  $M$ ,  $m$ ,  $S$ ,  $e_0$ ,  $i$ ,  $\theta_s$ ,  $\phi_s$ ,  $\theta_k$ ,  $\phi_k$ )
    - Detected to 1-3 Gpc, smaller  $\dot{f}$  is better  
(Gair & Wen 2005)

Label	Parameters	Initial $p/M$	SNR
A	See text	10.3	155
B	$M = 3 \times 10^5 M_\odot$	18.25	119
C	$M = 3 \times 10^6 M_\odot$	6.5	110
D	$m = 0.6 M_\odot$ , $M = 3 \times 10^5 M_\odot$	9.405	14.1
E	$m = 0.6 M_\odot$	5.83	21.0
F	$m = 0.6 M_\odot$ , $M = 3 \times 10^6 M_\odot$	4.511	15.7
G	$m = 100 M_\odot$	17.78	382
H	$a = 0.95M$	10.07	170
I	$a = 0.5M$	10.74	132
J	$a = 0.1M$	11.31	108
K	$e_0 = 0$	10.42	147
L	$e_0 = 0.1$	10.41	150
M	$e_0 = 0.25$	10.385	151
N	$e_0 = 0.7$	9.71	159
O	$\iota = 0$	9.925	223
P	$\iota = 30^\circ$	10.1	189
Q	$\iota = 60^\circ$	10.59	115
R	$\iota = 120^\circ$	12.126	57.7
S	$\iota = 150^\circ$	12.82	79.6
T	$\iota = 180^\circ$	13.11	87.0
ExtrinsA	$\cos(\theta_S) = 0.99$	10.3	117
ExtrinsB	$\cos(\theta_S) = 0.01$	10.3	162
ExtrinsC	$\cos(\theta_K) = 0.99$	10.3	118
ExtrinsD	$\cos(\theta_K) = 0.01$	10.3	146
ExtrinsE	$\phi_K = 0.01$	10.3	111
ExtrinsF	$\phi_K = 2.$	10.3	111

Table 1. Parameters and signal to noise ratios at 1 Gpc for trial waveforms. Unspecified parameters are the same as source “A”, as given in the text.

	0.8 Gpc	1.2 Gpc	1.4 Gpc	2 Gpc	3 Gpc
A	1	1	1	0.60	0.02
B	1	1	0.93	0.04	0.01
C	1	1	1	0.10	0.02
D	0.00	0.00	0.02	0.01	0.01
E	0.01	0.00	0.00	0.02	0.00
F	0.03	0.02	0.02	0.01	0.02
G	1	1	1	1	1
H	1	1	1	0.96	0.01
I	1	1	1	0.17	0.00
J	1	1	0.85	0.02	0.01
K	1	1	1	1	0.51
L	1	1	1	1	0.29
M	1	1	1	1	0.07
N	1	1	0.99	0.22	0.00
O	1	1	1	1	0.63
P	1	1	1	1	0.10
Q	1	1	0.85	0.03	0.00
R	0.8	0.02	0.04	0.00	0.01
S	1	0.53	0.1	0.02	0.02
T	1	0.96	0.36	0.01	0.01
ExtrinsA	1	1	0.65	0.02	0.01
ExtrinsB	1	1	1	0.94	0.03
ExtrinsC	1	1	0.82	0.03	0.02
ExtrinsD	1	1	1	0.31	0.02
ExtrinsE	1	0.99	0.57	0.03	0.02
ExtrinsF	1	0.99	0.62	0.02	0.02

Table 2. Detection rates for trial waveforms at various distances. Thresholds were set using the numerical probability distributions, and with an overall search false alarm probability of 1%.

# EMRIs: Time-Frequency Methods

## Comparison to (semi) coherent Method

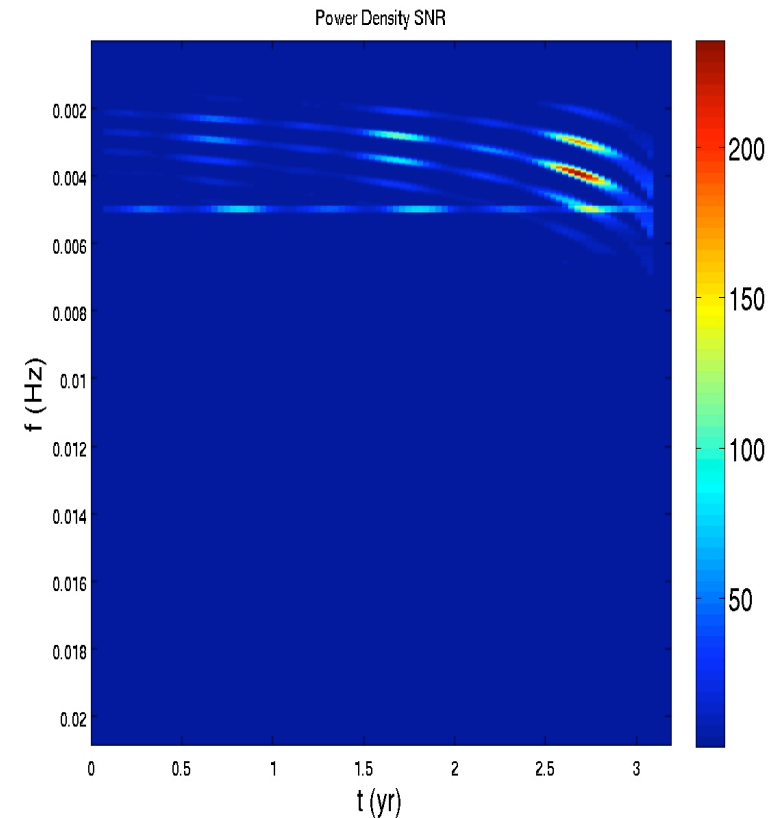
- Required SNR at the same FAP
$$\rho_{TF} \sim (m)^{1/4} \rho^{1/2}$$
$$\rho(FAP \sim 1\%) \sim 15$$
- Best case:  $m=1$ , signal concentrates in one t-f bin
  - e.g., sinusoidal signals/WD-WD inspirals
- Worst case, signal spreaded into all bins
- Performance is source dependent
  - Semi-coherent method searches
    - $\sim 1e15$  templates -> larger FAP
  - T-f method is incoherent
  - but much smaller numbers of searches

# Improvement on Detection

- So far detections are based on max. of one blob
  - Works very well
    - Detection EMRIs up to 1-3 Gpc
- Improving t-f method
  - Important to find the track
    - summing all powers on track
  - Worthwhile to search through directions
    - Take care of some confusion sources
  - Including known info of waveform

# WD-WD Confusion Problem

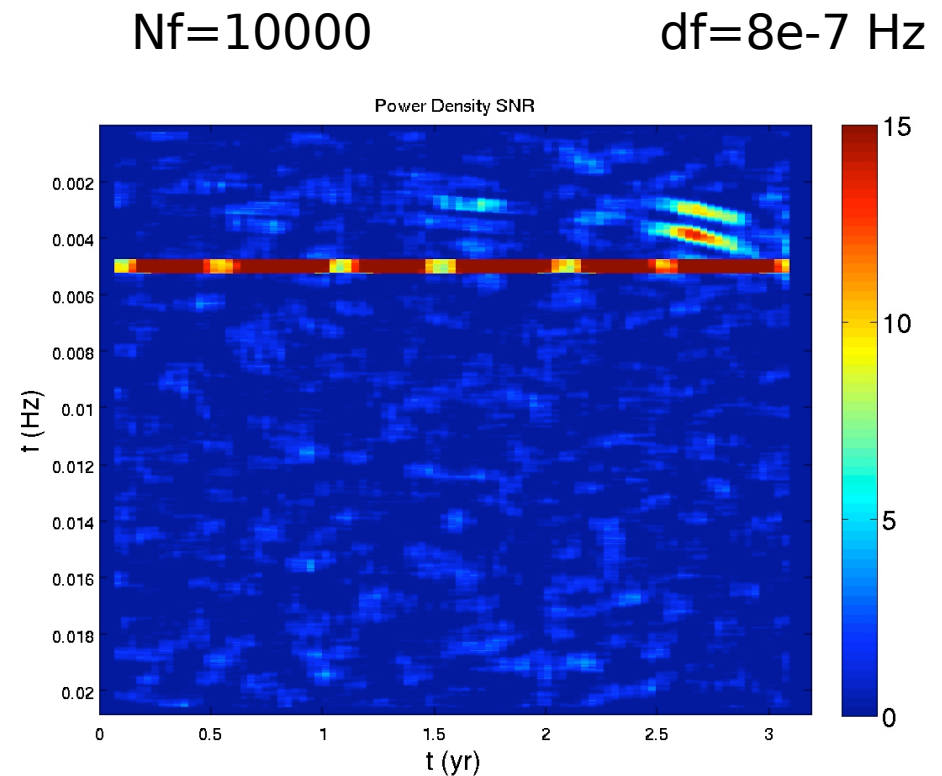
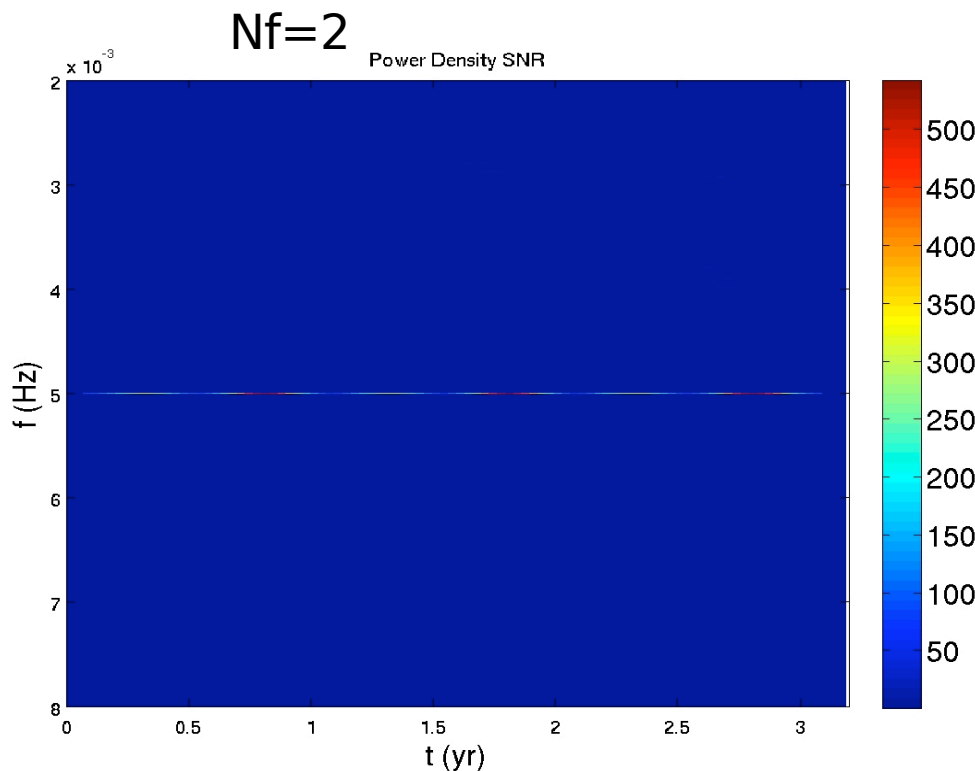
- Can always apply other technique to remove binaries
  - e.g., g-clean, Radon transform, MCMC
- Information extracted from t-f method:
  - Frequency/time spread
  - Directional information
  - T-f Track ->  $\langle f(t) \rangle$ 
    - curved track vs straight ones
  - Power->  $\langle dE(t)/dt \rangle$





# 1. Zoom-in with different t-f boxsizes

- Calculate power density with different boxsizes
- For different types of signal, max SNR most likely occurs at different boxsizes = camera zoom-in

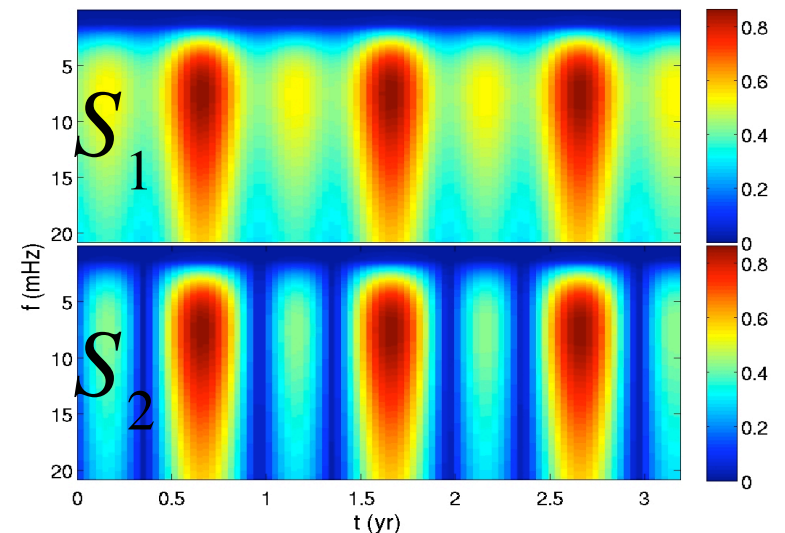
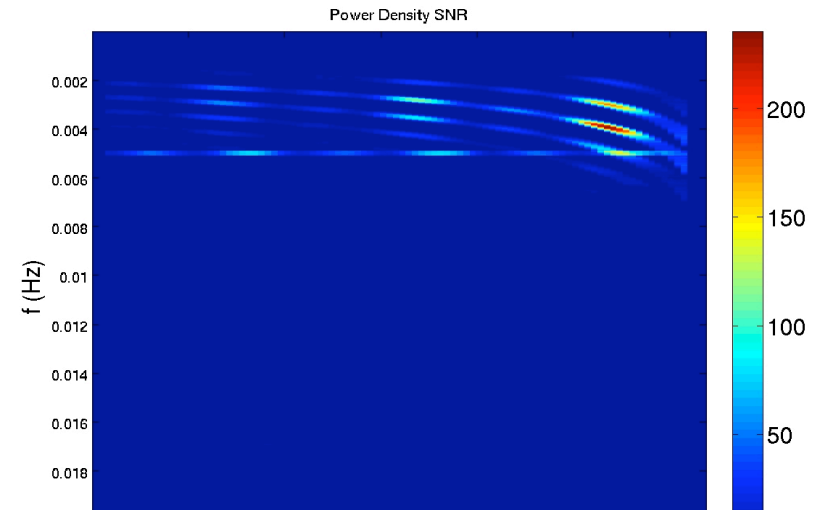


## 2. Decoding Directional Information

$$SNR^2 = (A \vec{h} | A \vec{h}) = s_1^2 h_1 + s_2^2 h_2$$

$$\vec{h}^T = v^T (h_+, h_x)^T, \quad v^T v = I$$

- Detections sensitivity can be ranked by (s1, s2)
  - **Red** region are more sensitive to GW signals
  - powers from these “designated” area should be added with priority



0-th order approximation (Cutler 98)

# Decoding directional information

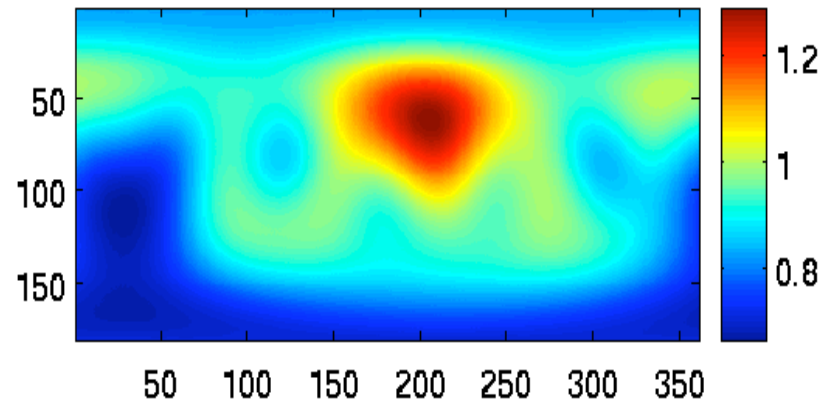
- Realistic LISA configuration encodes more directional information
- At higher  $f$ , it is equivalent to 3 detector-network
- high power at each source direction
- corresponding low power in null-stream of that direction (high  $f$ )

For one source direction

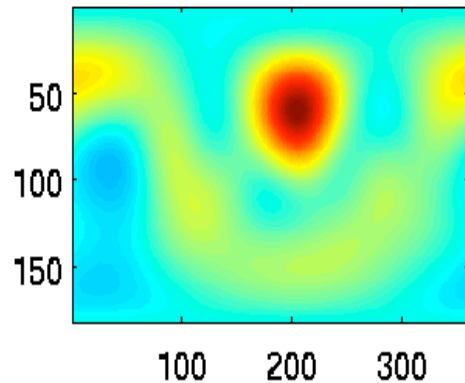
$$SNR^2 = (A \vec{h} | A \vec{h}) = s_1^2 h_1 + s_2^2 h_2$$

$$\vec{h}^T = v^T (h_+, h_x)^T, \quad v^T v = I$$

SNR1+SNR2

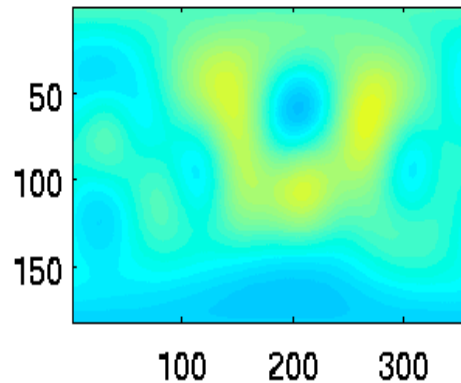


$v_+$



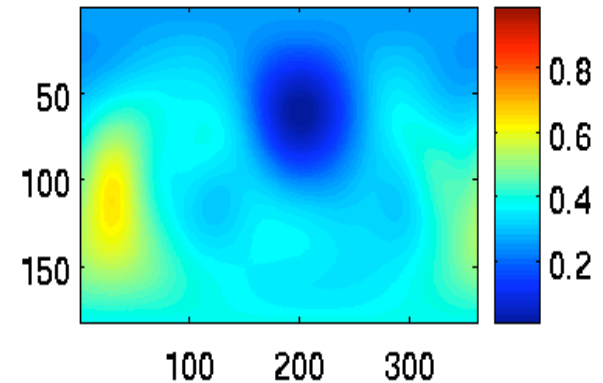
SNR1

$v_x$



SNR2

$v_0$



Null Stream

See Archana Pai's Poster

F=25 mHz

- Src from different direction has its own bright “blob” and dim spot in null-stream all sky map
- Brighter ones are selected first
- Worthwhile to search over directions

# Considerations on Parameter Estimation

- t-f method provided data points

*track*  $\rightarrow f_d(t_i)$ , *powers*  $\rightarrow dE/dt(t_i)$  ( $i=1, N$ ) (*averaged*)

- Also provide information on time-frequency spread of powers, **harmonics/beats**
- 2N data
- Assuming we know the relations between fn
- In case of PN formula, need to fit  $N+N_c$  parameters
  - In principle, just least-square fit parameters if  $N > N_c$  above threshold
  - $N_c \sim 7$   $e(t_i)$ , ( $i=1, N$ ),  $M, \mu, S \cos \lambda, n, \dots$ ,
- For multi-EMRIs: also least-square fit

# Conclusion

- Time-frequency method works pretty well
  - As the 1<sup>st</sup> step of the hierarchical search
- Current implementation can be further improved in detection/confusion problem
  - By finding the tracks
    - e.g., Hough transform
  - By search over source directions
- Parameters can be estimated/constrained
  - Need information that represent dominating  $f$ , and  $dE/dt$  in an averaged sense,

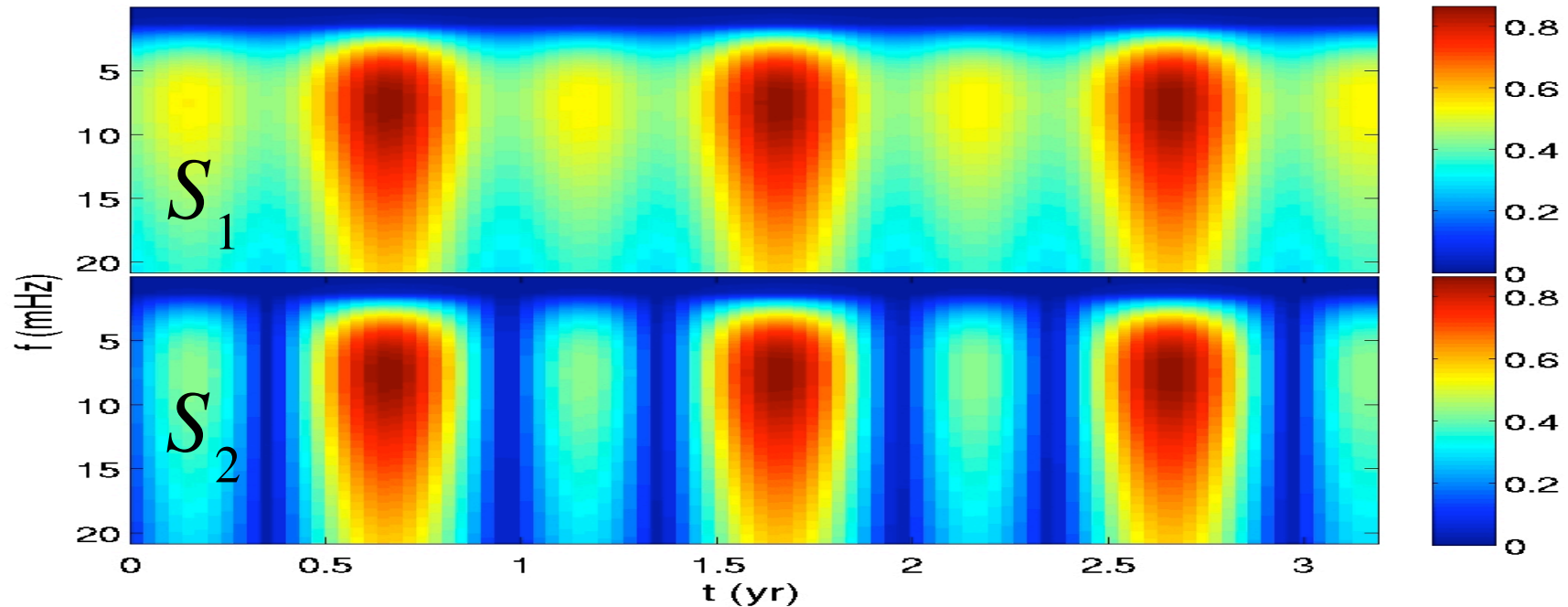
# LISA's Directional Sensitivity

Two orthogonal signal components

-for a given sky direction

$$SNR^2 = (A \vec{h} | A \vec{h}) = s_1^2 h_1 + s_2^2 h_2$$

where,  $\vec{h}^T = (h_1, h_2)^T = v^T (h_+, h_x)^T, \quad v^T v = I$



See also Rajesh et al (2003)

$(\phi_s = 60^\circ, \theta_s = 57^\circ (Ecliptic))$